

ABNORMAL SHADOW DETECTING METHOD, ABNORMAL SHADOW DETECTING
SYSTEM AND ABNORMAL SHADOW DETECTING PROGRAM

BACKGROUND OF THE INVENTION

5 Field of the Invention

This invention relates to a method of and a system and a program for detecting an abnormal shadow in a radiation image, and more particularly to an improvement in detecting a prospective abnormal shadow.

10 Description of the Related Art

In the medical field, to find a diseased part of a patient or to observe a diseased part of a patient and diagnose progress of disease by reading a radiation image of the object (patient) has been a common operation. However, radiation image reading
15 often depends upon experience and abilities of the reader and is not necessarily objective.

For example, it is necessary to find an abnormal shadow representing a growth and/or a micro calcification representative of a cancerous part in a mammogram (a radiation
20 image of a breast) taken for the purpose of a breast cancer examination. However, depending on the reader, the abnormal shadow range cannot be properly detected. Accordingly, there has been a demand to properly detect an abnormal shadow including shadows of a growth and a micro calcification
25 irrespective of the abilities of the reader.

In order to meet this demand, there have been proposed

abnormal shadow detecting systems, for instance, in U.S.
Patent No. 5,761,334 in which a prospective abnormal shadow
region in an image of an object is automatically detected by
the use of a computer on the basis of image data representing
5 the image.

In the abnormal shadow detecting system, a prospective
abnormal shadow region is automatically detected by the use
of an iris filter processing which is mainly suitable for
detecting a growth shadow and/or a morphology filter which is
10 mainly suitable for detecting a micro calcification shadow.

In order to improve prospective region detecting
accuracy, there has been proposed, for instance, in Japanese
Unexamined Patent Publication No. 2002-109510, a method of
detecting a prospective abnormal shadow region in two stages
15 where a characteristic value on the image is calculated for
the prospective abnormal shadow regions detected by the
technology described above and whether or not the prospective
abnormal shadow region is of a malignant one is determined on
the basis of the calculated characteristic value.

20 Recently, there have been proposed various methods of
detecting a prospective abnormal shadow region in addition to
the methods using the iris filter and a morphology filter.
However, whether or not the prospective abnormal shadow region
is of a malignant one is determined by the same method
25 irrespective of the method of detecting a prospective abnormal
shadow region.

Since the prospective abnormal shadow region has a characteristic which differs by the kind of detection used for detecting the prospective abnormal shadow region, the method where whether or not the prospective abnormal shadow region is of a malignant one is determined by the same method irrespective of the method of detecting a prospective abnormal shadow region cannot fully utilize the characteristic of the prospective abnormal shadow region, which can result in deterioration in abnormal shadow detecting performance.

SUMMARY OF THE INVENTION

In view of the foregoing observations and description, the primary object of the present invention is to provide a method of and a system and a program for detecting an abnormal shadow in a radiation image in which the performance of detecting a prospective abnormal shadow can be improved.

In accordance with a first aspect of the present invention, there is provided an abnormal shadow detecting method comprising the steps of detecting primary prospective abnormal shadow regions in images of objects by different kinds of detecting processes, determining whether or not the respective primary prospective abnormal shadow regions are of a desired abnormal shadow by methods different from each other according to the kinds of processes by which the respective primary prospective abnormal shadow regions are detected, and outputting as final prospective abnormal shadow regions only primary prospective abnormal shadow regions which are

determined to be of a desired abnormal shadow.

In accordance with a second aspect of the present invention, there is provided an abnormal shadow detecting system comprising a primary prospective region detecting means
5 which detects primary prospective abnormal shadow regions in images of objects on the basis of image data representing the images of the objects by different kinds of detecting processes, a determining means which determines whether or not the
10 respective primary prospective abnormal shadow regions are of a desired abnormal shadow by methods different from each other according to the kinds of processes by which the respective primary prospective abnormal shadow regions are detected, and a final prospective abnormal shadow region outputting means
15 which outputs as final prospective abnormal shadow regions only primary prospective abnormal shadow regions which are determined to be of a desired abnormal shadow.

The detecting processes may include, for instance, a process mainly for detecting a growth shadow region in which convergence of density gradients in the image of the object
20 is calculated by the use of an iris filter and a prospective growth shadow region is detected by extracting a region where the convergence of density gradients is high, a process mainly for detecting a prospective category 3 growth shadow region by extracting a region where the contrast is high and the
25 boundary is clear, a process mainly for detecting a prospective asymmetric shadow region in which left and right mammary gland

distributions are compared with each other and a prospective asymmetric shadow region is detected by extracting regions where left and right mammary gland distributions are not symmetric, and a process mainly for detecting a prospective spicule region in which convergence of lines in the lineation is calculated and a prospective spicule region is detected by extracting a region where the convergence of lines is high. The "category 3 growth shadow" is a shadow of an abnormal tissue which is generally benignant but possibility of being malignant of which cannot be denied, and the "spicule" is a shadow of a linear abnormal tissue which appears along a mammary gland of a breast.

The "desired abnormal shadow" may be, for instance, "a malignant abnormal shadow", or "a benignant abnormal shadow" or "a malignant abnormal shadow and a benignant abnormal shadow". That is, when only a malignant abnormal shadow is to be detected, the "desired abnormal shadow" is "a malignant abnormal shadow" and when only a benignant abnormal shadow is to be detected, the "desired abnormal shadow" is "a benignant abnormal shadow". Further, when a malignant abnormal shadow and a benignant abnormal shadow are to be detected together, the "desired abnormal shadow" is "a malignant abnormal shadow and a benignant abnormal shadow".

Whether or not the respective primary prospective abnormal shadow regions are of a desired abnormal shadow may be determined on the basis of a combination of a plurality of

characteristic values for the respective primary prospective abnormal shadow regions predetermined by the kinds of processes by which the respective primary prospective abnormal shadow regions are detected. In this case, whether or not the
5 respective primary prospective abnormal shadow regions are of a desired abnormal shadow may be determined on the basis of Mahalanobis distances in the plurality of characteristic values.

The "characteristic values for the prospective abnormal shadow region" are those representing features of the
10 prospective abnormal shadow region and at the same time representing malignancy or benignancy of the prospective abnormal shadow region and include, for instance, dispersion, contrast, and an angular moment representing features of a
15 density histogram for the prospective abnormal shadow region, dispersion, deviation, correlation, moment and entropy representing features of surrounding parts of the prospective abnormal shadow region, and circularity representing features in shape of the prospective abnormal shadow region.

20 The "Mahalanobis distance" is an index of distance used for recognition of an image pattern and the value of the Mahalanobis distance represents similarity in image pattern of one image to another image. A plurality of characteristic values representing features of an image pattern are expressed
25 in vectors, and the "Mahalanobis distance" is defined to reflect difference in vector between a reference image and an image

to be recognized.

Further it is possible to determine whether or not the respective primary prospective abnormal shadow regions are of a desired abnormal shadow by the likelihood ratio based on a Mahalanobis distance. The likelihood ratio based on a Mahalanobis distance is defined by a ratio $Dm1/Dm2$ of a Mahalanobis distance $Dm1$ from a pattern class representing a non-malignant shadow which has been empirically obtained to a Mahalanobis distance $Dm2$ from a pattern class representing a malignant shadow which has been empirically obtained. It may be judged that the larger the likelihood ratio is, the possibility that the region is of a malignant shadow is stronger, and the smaller the likelihood ratio is, the possibility that the region is of a non-malignant shadow is stronger. Accordingly, for instance, it may be determined that the region is of a malignant shadow, when the likelihood ratio is not smaller than a threshold value and that the region is of a non-malignant shadow, when the likelihood ratio is smaller than the threshold value.

In accordance with a third aspect of the present invention, there is provided a computer program for causing a computer to execute an abnormal shadow detecting process comprising the steps of detecting primary prospective abnormal shadow regions in images of objects by different kinds of detecting processes, determining whether or not the respective primary prospective abnormal shadow regions are of a desired

abnormal shadow by methods different from each other according to the kinds of processes by which the respective primary prospective abnormal shadow regions are detected, and outputting as final prospective abnormal shadow regions only
5 primary prospective abnormal shadow regions which are determined to be of a desired abnormal shadow.

In the present invention, a breast is especially suitable as the object.

In accordance with the present invention, since the
10 determination process (for determining whether or not the primary prospective abnormal shadow region is of a desired abnormal shadow) is carried out by a method according to the kind of the detection process (by which the primary prospective abnormal shadow region is detected), the determination process
15 can fully utilize the characteristic of the prospective abnormal shadow region reflecting the feature of the detection process employed, whereby the accuracy in determination can be improved and the abnormal shadow detecting performance can be improved.

20 When the determination process is carried out on the basis of a combination of a plurality of characteristic values for the respective primary prospective abnormal shadow regions predetermined by the kinds of the detection process, change in detection process can be dealt with by simply changing the
25 combination of the characteristic values, whereby the determination process can be relatively easily arranged and

improvement of the accuracy in determination can be flexibly attempted.

When the determination process is carried out on the basis of Mahalanobis distances in the plurality of characteristic values, the determination process can be carried out on the basis of similarity of the prospective abnormal shadow region to an empirically obtained malignant abnormal shadow or an empirically obtained benignant abnormal shadow, surer determination can be performed.

Since the determination process for narrowing down prospective abnormal shadow regions detected by the detection process has borne fruit especially in detection of breast cancer, whether or not the primary prospective abnormal shadow region is of a desired abnormal shadow can be more surely determined when the object is a breast.

BRIEF DESCRIPTION OF THE DRAWINGS

Figure 1 is a view schematically showing an abnormal shadow detecting system in accordance with an embodiment of the present invention.

DESCRIPTION OF THE PREFERRED EMBODIMENT

In Figure 1, an abnormal shadow detecting system 1 in accordance with an embodiment of the present invention comprises a primary prospective region detecting means 10 which detects primary prospective abnormal shadow regions in images of objects on the basis of image data P representing the images of the objects by different kinds of detecting

processes, a determining means 20 which determines whether or not the respective primary prospective abnormal shadow regions are of a desired abnormal shadow by methods different from each other according to the kinds of processes by which the
5 respective primary prospective abnormal shadow regions are detected, and a final prospective abnormal shadow region outputting means 30 which outputs as final prospective abnormal shadow regions Qj only primary prospective abnormal shadow regions which are determined to be of a desired abnormal
10 shadow.

The primary prospective region detecting means 10 comprises an iris filter detecting means 11 mainly for detecting a primary prospective growth shadow region, a contrast detecting means 12 mainly for detecting a primary
15 prospective category 3 growth shadow region, an asymmetry detecting means 13 mainly for detecting a primary prospective asymmetric shadow region, and a spicule detecting means 14 mainly for detecting a primary prospective spicule region.

The determining means 20 comprises an iris filter
20 determining means 21 which determines whether or not the primary prospective abnormal shadow regions Q1i detected by the iris filter detecting means 11 are of a desired abnormal shadow, a contrast determining means 22 which determines whether or not the primary prospective abnormal shadow regions
25 Q2i detected by the contrast detecting means 12 are of a desired abnormal shadow, an asymmetry determining means 23 which

determines whether or not the primary prospective abnormal shadow regions Q3i detected by the asymmetry detecting means 13 are of a desired abnormal shadow, and a spicule determining means 24 which determines whether or not the primary prospective abnormal shadow regions Q4i detected by the spicule detecting means 14 are of a desired abnormal shadow.

Operation of the abnormal shadow detecting system of this embodiment will be described hereinbelow. In this particular embodiment, the object image is a radiation image of a breast, and the desired abnormal shadow is a malignant abnormal shadow.

When image data P representing a radiation image of a breast is input into the abnormal shadow detecting system 1, the iris filter detecting means 11 calculates convergence of density gradients in the radiation image P by the use of an iris filter on the basis of the image data P and detects four (at most) regions which are higher than any other regions in the convergence of density gradients as the primary prospective abnormal shadow regions Q1k. Then the iris filter determining means 21 calculates a combination G1 of a plurality of characteristic values in the respective primary prospective abnormal shadow regions Q1k. The combination G1 is of a plurality of characteristic values which are suitable for determining whether or not the primary prospective abnormal shadow region Q1k is of a desired abnormal shadow. Further, the iris filter determining means 21 determines whether or not the primary prospective abnormal shadow region Q1k is of a

malignant abnormal shadow by the use of Mahalanobis distances of the characteristic values in the combination G1 calculated.

First, the Mahalanobis distance Dm1 of the primary prospective region from a pattern class (i=1) representing a non-malignant shadow which has been empirically determined and the Mahalanobis distance Dm2 of the primary prospective region from a pattern class (i=2) representing a malignant shadow which has been empirically determined are calculated according to the following formula (1).

$$Dmi = \left(\begin{matrix} \longrightarrow_x \\ \longrightarrow_{mi} \end{matrix} \right)' \sum_i^{-1} \left(\begin{matrix} \longrightarrow_x \\ \longrightarrow_{mi} \end{matrix} \right) \cdots (1)$$

wherein \sum_i represents a covariance matrix of a pattern class (a non-malignant pattern, when i=1, a malignant pattern when i=2) wi, that is,

$$\sum_i = (1/Ni) \sum_{x \in wi} \left(\begin{matrix} \longrightarrow_x \\ \longrightarrow_{mi} \end{matrix} \right) \left(\begin{matrix} \longrightarrow_x \\ \longrightarrow_{mi} \end{matrix} \right)'$$

wherein t represents a transposed vector (a transverse vector),

\longrightarrow_x represents a characteristic value x in vector (that is,

$\longrightarrow_x = (x1, x2, \cdots, xN)$, \sum_i^{-1} represents an inverse matrix of

\sum_i , and \longrightarrow_{mi} represents the average of the pattern class wi

(that is, $\longrightarrow_{mi} = (1/Ni) \sum_{x \in wi} \longrightarrow_x$).

The characteristic values in the combination G1 respectively correspond to x1 to xN and express an N-dimensional space (x1, x2, \cdots , xN). The Mahalanobis distance between the pattern of the primary prospective region

as expressed on the N-dimensional pattern space and the pattern of a non-malignant shadow as expressed on the N-dimensional pattern space is $Dm1$, the Mahalanobis distance between the pattern of the primary prospective region as expressed on the N-dimensional pattern space and the pattern of a malignant shadow as expressed on the N-dimensional pattern space is $Dm2$.

The non-malignant shadow pattern and the malignant shadow pattern are pattern spaces defined by vectors x which have been set respectively for non-malignant shadows and malignant shadows on the basis of the result of investigation on a lot of prospective abnormal shadows. For example, the pattern class $w1$ of non-malignant shadows is defined by the average of the vectors x of non-malignant shadows, and the pattern class $w2$ of malignant shadows is defined by the average of the vectors x of malignant shadows.

For example, when the prospective region is of a malignant shadow, there is a tendency for the Mahalanobis distance from the pattern class of the malignant shadow to be short ($Dm2$ is small) and for the Mahalanobis distance from the pattern class of the non-malignant shadow to fluctuate. To the contrast, when the prospective region is of a non-malignant shadow, there is a tendency for the Mahalanobis distance from the pattern class of the non-malignant shadow to be short ($Dm1$ is small) and for the Mahalanobis distance from the pattern class of the malignant shadow to fluctuate. A likelihood ratio ($Dm1/Dm2$) for distinguishing the malignant shadow from the

non-malignant shadow according to these tendencies is calculated for each of the prospective regions.

The likelihood ratio is defined by $Dm1/Dm2$ and as the likelihood ratio is larger, the probability that the prospective region is of a malignant shadow is stronger and as the likelihood ratio is smaller, the probability that the prospective region is a non-malignant shadow is stronger. For instance, it is determined that the prospective region is of a malignant shadow when the likelihood ratio is not smaller than a predetermined threshold value Th , and that the prospective region is of a non-malignant shadow when the likelihood ratio is smaller than the threshold value Th .

Then the contrast detecting means 12 calculates on the basis of the image data P an index representing contrast to the surrounding and clearness of the boundary and detects two (at most) regions which are higher than any other regions in the index as the primary prospective abnormal shadow regions (of a category 3 growth shadow) $Q2k$. Then the contrast determining means 22 calculates a combination $G2$ of a plurality of characteristic values in the respective primary prospective abnormal shadow regions $Q2k$. The combination $G2$ is of a plurality of characteristic values which are suitable for determining whether or not the primary prospective abnormal shadow region $Q2k$ is of a desired abnormal shadow. Further, the contrast determining means 22 calculates a likelihood ratio of Mahalanobis distances from the combination $G2$ of a

plurality of characteristic values calculated and determines that the primary prospective abnormal shadow region Q2k is of a malignant abnormal shadow when the likelihood ratio is not smaller than a predetermined threshold value.

5 Similarly, the asymmetry detecting means 13 calculates on the basis of the image data P the degree of asymmetry and detects one (at most) region which is higher than any other regions in the degree of asymmetry as the primary prospective abnormal shadow regions (of an asymmetric shadow) Q3k. Then
10 the asymmetry determining means 23 calculates a combination G3 of a plurality of characteristic values in the respective primary prospective abnormal shadow regions Q3k. Further, the asymmetry determining means 23 calculates a likelihood ratio of Mahalanobis distances from the combination G3 of a plurality
15 of characteristic values calculated and determines that the primary prospective abnormal shadow region Q3k is of a malignant abnormal shadow when the likelihood ratio is not smaller than a predetermined threshold value.

 Similarly, the spicule detecting means 14 calculates the
20 convergence of lines in the lineation and detects two (at most) region which is higher than any other regions in the convergence of lines in the lineation as the primary prospective abnormal shadow regions (mainly of a spicule shadow) Q4k. Then the spicule determining means 24 calculates a combination G4 of
25 a plurality of characteristic values in the respective primary prospective abnormal shadow regions Q4k. Further, the spicule

determining means 24 calculates a likelihood ratio of Mahalanobis distances from the combination G4 of a plurality of characteristic values calculated and determines that the primary prospective abnormal shadow region Q4k is of a malignant abnormal shadow when the likelihood ratio is not smaller than a predetermined threshold value.

The combinations G1 to G4 may be, for instance, as shown in the following table 1. That is, the combination G1 to be calculated for the primary prospective abnormal shadow regions Q1k detected by the iris filter detecting means 11 may include a quadric statistic "Correlation", a quadric statistic "Difference Entropy", skewness in the circle, entropy in the circle, kurtosis in the ring and the like, the combination G2 to be calculated for the primary prospective abnormal shadow regions Q2k detected by the contrast detecting means 12 may include a quadric statistic "Correlation", a quadric statistic "Inverse Difference Moment", a quadric statistic "Difference Entropy", a quadric statistic "Sum Entropy", secondary moment in the circle and the like, the combination G3 to be calculated for the primary prospective abnormal shadow regions Q3k detected by the asymmetry detecting means 13 may include a quadric statistic "Inverse Difference Moment", skewness in the circle, entropy in the circle, kurtosis in the ring, entropy in the ring and the like, and the combination G4 to be calculated for the primary prospective abnormal shadow regions Q4k detected by the spicule detecting means 14 may include

secondary moment in the circle, secondary moment in the ring, entropy in the ring, a quadric statistic "Difference Variance", a quadric statistic "Information Measure of Correlation 1" and the like.

Characteristic value	Combination of characteristic values			
	G1	G2	G3	G4
Quadric statistic:Correlation	○	○		
Quadric statistic:Sum of Squares:Variance				
Quadric statistic:Inverse Difference Moment		○	○	
Quadric statistic:Difference Entropy	○	○		
Quadric statistic:Sum Entropy		○		
Spreadness				
Variance in the Circle				
Secondary Moment in the Circle		○		○
Energy in the Circle				
area				
Variance in the Ring				
Energy in the Ring				
Secondary Moment in the Ring		○		○
Skewness in the Circle		○	○	
Kurtosis in the Circle	○			
Average in the Circle				
Entropy in the Circle	○	○	○	
Skewness in the Ring		○		
Kurtosis in the Ring	○		○	

Average in the Ring				
Entropy in the Ring	○	○	○	○
Quadric Statistic:Angular Second moment	○			
Quadric Statistic:Contrast				
Quadric Statistic:Sum Average	○			
Quadric Statistic:Sum Variance	○			
Quadric Statistic:Entropy		○		
Quadric Statistic:Difference Variance			○	○
Quadric Statistic:Information measure of Correlation 1			○	○
Quadric Information measure of Correlation 2		○		
Quadric Statistic:Maximal Correlation Coefficient				

The final prospective abnormal shadow region outputting means 30 outputs as final prospective abnormal shadow regions Qj only primary prospective abnormal shadow regions which are determined to be of a desired abnormal shadow by the respective determining means. A plurality of prospective abnormal shadow regions which are close to each other in the center thereof or the center of gravity of brightness may be united to one prospective region so that one region is not repeatedly detected as the prospective abnormal shadow region.

In the abnormal shadow detecting system 1 of this embodiment, since the primary prospective region detecting means 10 detects primary prospective abnormal shadow regions in images of objects in different processes on the basis of image data P representing the objects, the determining means

20 determines whether or not the respective primary
prospective abnormal shadow regions are of a desired abnormal
shadow by methods different from each other according to the
kinds of processes by which the respective primary prospective
5 abnormal shadow regions are detected, and a final prospective
abnormal shadow region outputting means 30 outputs as final
prospective abnormal shadow regions only primary prospective
abnormal shadow regions which are determined to be of a desired
abnormal shadow, the determination process can fully utilize
10 the characteristic of the prospective abnormal shadow region
reflecting the feature of the detection process employed,
whereby the accuracy in determination can be improved and the
abnormal shadow detecting performance can be improved.

Though, in the embodiment described above, the
15 characteristic values in each prospective abnormal shadow
region are calculated, each time one detecting means detects
prospective abnormal shadow regions, the characteristic
values in each prospective abnormal shadow region may be
calculated in other procedures without limited to the
20 procedure described above in conjunction with the above
embodiment. For example, the characteristic values in each
prospective abnormal shadow region may be calculated after all
the detecting means detects the primary prospective abnormal
shadow regions.

25 Further, combinations of characteristic values are only
an example and may be variously arranged.